RESEARCH Open Access

Differential gene expression associated with a floral scent polymorphism in the evening primrose *Oenothera harringtonii* (Onagraceae)

Lindsey L. Bechen^{1,2*}, Matthew G. Johnson^{1,3}, Geoffrey T. Broadhead^{4,5}, Rachel A. Levin², Rick P. Overson^{1,6}, Tania Jogesh¹, Jeremie B. Fant^{1,7}, Robert A. Raguso⁴, Krissa A. Skogen^{1,7} and Norman J. Wickett^{1,7*}

Abstract

Background: Plant volatiles play an important role in both plant-pollinator and plant-herbivore interactions. Intraspecific polymorphisms in volatile production are ubiquitous, but studies that explore underlying differential gene expression are rare. *Oenothera harringtonii* populations are polymorphic in floral emission of the monoterpene (R)-(—)-linalool; some plants emit (R)-(—)-linalool (linalool+ plants) while others do not (linalool- plants). However, the genes associated with differential production of this floral volatile in *Oenothera* are unknown. We used RNA-Seq to broadly characterize differential gene expression involved in (R)-(—)-linalool biosynthesis. To identify genes that may be associated with the polymorphism for this trait, we used RNA-Seq to compare gene expression in six different *Oenothera harringtonii* tissues from each of three linalool+ and linalool- plants.

Results: Three clusters of differentially expressed genes were enriched for terpene synthase activity: two were characterized by tissue-specific upregulation and one by upregulation only in plants with flowers that produce (R)-(—)-linalool. A molecular phylogeny of all terpene synthases identified two putative (R)-(—)-linalool synthase transcripts in *Oenothera harringtonii*, a single allele of which is found exclusively in linalool+ plants.

Conclusions: By using a naturally occurring polymorphism and comparing different tissues, we were able to identify candidate genes putatively involved in the biosynthesis of (R)-(—)-linalool. Expression of these genes in linalool-plants, while low, suggests a regulatory polymorphism, rather than a population-specific loss-of-function allele. Additional terpene biosynthesis-related genes that are up-regulated in plants that emit (R)-(—)-linalool may be associated with herbivore defense, suggesting a potential economy of scale between plant reproduction and defense.

Keywords: Linalool, RNA-Seq, Terpene synthase, Volatile, Transcriptome, Floral scent, Floral fragrance

Background

Floral fragrance is a complex trait that is typically composed of tens to hundreds of volatile organic compounds (VOCs) whose ecological roles include the attraction of pollinators, manipulation of pollinator behavior, and

defense against herbivores [1–7]. Considerable qualitative and quantitative variation in floral fragrance has been documented, with over 1700 floral volatiles having been described from more than 900 angiosperm species [8]. In addition to substantial interspecific variation, floral fragrance has also been shown to differ intra-specifically [2, 9]. The evolutionary and ecological mechanisms that maintain intraspecific variation in floral fragrance constitute an active area of research and have been attributed to differences in community composition, pollinator

 $^{^7}$ Northwestern University, 2205 Tech Drive, Evanston, IL 60208, USA Full list of author information is available at the end of the article



© The Author(s) 2022. **Open Access** This article is licensed under a Creative Commons Attribution 4.0 International License, which permits use, sharing, adaptation, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons licence, and indicate if changes were made. The images or other third party material in this article are included in the article's Creative Commons licence, unless indicated otherwise in a credit line to the material. If material is not included in the article's Creative Commons licence and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this licence, visit http://creativeccommons.org/licenses/by/4.0/. The Creative Commons Public Domain Dedication waiver (http://creativecommons.org/publicdomain/zero/1.0/) applies to the data made available in this article, unless otherwise stated in a credit line to the data.

^{*}Correspondence: lindseybechen@gmail.com; nwickett@chicagobotanic.org ² Department of Biology, Amherst College, 25 East Drive, Amherst, MA

^{01002,} USA

Bechen et al. BMC Genomics (2022) 23:124 Page 2 of 17

preferences, phenotypic plasticity, and genetic drift [10-13].

The biosynthetic pathways that produce floral volatiles are increasingly well-characterized [14], and recent studies have used transcriptomics-based approaches to identify homologous genes from these pathways in nonmodel plant species [15–18]. Despite these advances [19, 20], relatively few studies have identified the genetic mechanisms that impact how these pathways modify floral scent or how selection acts on the resulting intraspecific variation. Volatile terpenes comprise a major source of biosynthetic diversity in scents, primarily 10-carbon monoterpenes and 15-carbon sesquiterpenes [21]. Terpene synthase (TPS) enzymes, which are involved in the biosynthesis of these secondary metabolites, are encoded by a moderately large gene family in angiosperms [22]. The TPS genes exist in seven to eight subfamilies that show either lineage-specific (e.g., exclusively gymnosperm TPSs) or molecule/lineage-specific (e.g., monocot sesquiterpene TPSs) affinities. Despite the widespread characterization of the gene family and their products across plant lineages [22, 23], the mechanisms maintaining intraspecific variation in the production of volatile terpenes remain poorly understood. The functional implications of intraspecific terpenoid variation are epitomized by the culinary herb Thymus vulgaris (Lamiaceae), whose distinct "chemotypes" differ in herbivore defense, frost sensitivity, and allelopathic interactions with neighboring plants [24, 25]. Genetic crosses helped to document an epistatic network of mendelian loci responsible for volatile chemotypes in *T. vulgaris* [26, 27]. However, beyond a few such model systems, the genetic controls of chemotype variation remain largely unknown, and this knowledge is needed to understand how conflicting selective forces shape chemical polymorphism. To date, there have been few opportunities to study the genetic underpinnings of volatile terpenoid polymorphism in floral scent.

The focal species of this study, *Oenothera harringtonii* (Onagraceae), is a night-blooming, self-incompatible annual herb [28] that displays intraspecific variation among populations in the floral scent compound, (R)-(-)-linalool. Extensive pilot surveys (335 samples, 15–30 individuals per population, 12 populations) revealed that (R)-(-)-linalool is either emitted as an abundant floral volatile or is absent from the floral headspace of *O. harringtonii* plants (Additional file 4). Both enantiomers of this monoterpene alcohol, (R)-(-)-linalool and (S)-(+)-linalool, have been reported in a wide variety of plant families and are common components of floral scent, especially in nocturnal mothpollinated flowers [29]. Other night-blooming species across the genus *Oenothera* have been found to emit

(R)-(-)-linalool, including O. biennis (sect. Oenothera [30];), O. acutissima (sect. Lavauxia [31];), O. californica (sect. Anogra), O. cespitosa (sect. Pachylophus), O. howardii (sect. Megapterium), O. lavandulifolia (sect. Calylophus) and O. xylocarpa (sect. Contortae); Jogesh, Skogen, and Raguso unpublished data). Linalool in floral tissues can function as a pollinator attractant or as a defense compound [32-35], whereas linalool emitted by vegetative tissues has been implicated in both direct and indirect plant defenses [34]. Flowers of O. harringtonii are pollinated by the widespread hawkmoth species Hyles lineata and Manduca quinquemaculata [36]. Parallel studies suggest that these hawkmoths are likely attracted to the strong floral scent and high visual contrast of O. harringtonii flowers [37, 38]. In addition to its role in plant reproduction, the primary pollinator *H. lineata* is also an herbivore of the plant, with its caterpillars feeding on leaves and floral tissues. Furthermore, the developing seeds of O. harringtonii are consumed by caterpillars of the moth genus Mompha [39], whose adults oviposit on flowers at dusk [40]. Considering these selective forces, it is likely that both floral scent and volatiles emitted by vegetative tissues play important roles in the complex fitness landscape of this species. However, understanding how these selective forces mold volatile terpene variation requires the identification of genes, including (R)-(-)linalool synthase and related terpene synthases, that are associated with scent polymorphism in O. harringtonii. In this way, identification and subsequent manipulation of the (S)-(+) linalool synthase gene in a wild tobacco, Nicotiana attenuata, led to novel insights about geographic variation in selective pressures and the importance of terpenoid volatile background in a tri-trophic/ plant defense context [41].

Within the family Onagraceae, the gene encoding (S)-(+)-linalool synthase was identified from Clarkia breweri and Clarkia concinna in the first study of biosynthetic genes responsible for floral scent [42]. However, (R)-(-)linalool synthase has not been identified in any evening primrose species to date, and only a single, partial TPS sequence has been identified thus far in Oenothera [43], one of the most species-rich lineages within the family [44]. In this study, we use RNA-Seq to identify differentially expressed genes (DEGs) correlated with linalool production in O. harringtonii by sequencing transcriptomes of six different tissues from three biological replicates of each of two chemotypes: (1) flowers that emit (R)-(-)-linalool (linalool+) and (2) flowers that do not emit (R)-(-)-linalool (linalool-). We use this information, in combination with a phylogenetic analysis of terpene synthases, to identify a candidate gene that may encode (R)-(-)-linalool synthase in O. harringtonii and identify an allele that is specific to the linalool+ individuals

Bechen et al. BMC Genomics (2022) 23:124 Page 3 of 17

sampled here. This study includes the first transcriptomes assembled for *O. harringtonii*, providing critical genomic information to inform ongoing studies of intraspecific floral scent variation within this species. In addition, the preliminary identification of (R)-(—)-linalool synthase and other differentially expressed transcripts is a first step towards a broader, comparative analysis of the molecular evolution of floral scent among species of *Oenothera* that differ in mating system, pollination mode, life history strategy and, thus, the direction and intensity of natural selection (see [45]). As such, results of the present study provide a key foundational step in understanding the phylogenetic ubiquity of genes involved in the biosynthesis of (R)-(—)-linalool throughout flowering plants.

Results and discussion

Floral fragrance analysis

Floral scent profiles were collected from replicated linalool+ and linalool- plants from which expressed transcripts were subsequently harvested; volatile chemical data are summarized in Table 1. Across all individuals, the floral scent was dominated by the monoterpene olefin (E)- β -ocimene, with small amounts of other monoterpenes ((Z)- β -ocimene and β -myrcene) and sesquiterpenes $(\beta$ -caryophyllene and (E,E)-farnesol). The flowers of three individuals (A-C) emitted large amounts of (R)-(-)-linalool (linalool+), whereas those from another three individuals did not emit any (Table 1; Fig. 1A). This pattern is consistent with phenotypic data from the source populations for these plants (Additional file 4), confirming that linalool chemotypes breed true in greenhouse-grown plants (see Methods). Other volatiles (ocimene

epoxide, methyl geranate, isophytol, α -humulene, and methyl benzoate) were emitted in small amounts by some individuals but not others, but the presence of these compounds varied independently of linalool chemotype (as they did in field-collected samples; Additional file 4) and are therefore likely due to unrelated factors.

Additional analyses were performed to confirm which of the two enantiomers of linalool were present in the floral scent. Chiral GC-MS analyses resulted in the separation of linalool enantiomers to baseline, with (R)-(-)-linalool (14.07 min) eluting before (S)-(+)-linalool (14.14 min) under the conditions described (Fig. 1B). When the linalool peaks from linalool+ populations (Florence, Maverick, Baculite Mesa) were found to align with the retention time of the (R)-(-) enantiomer, but not with that of the (S)-(+) enantiomer or the linalool peak from *Clarkia breweri*, we re-injected an *O. harringtonii* headspace sample from the Florence population, to which a small amount of the (R)-(-) enantiomer was added. These analyses confirmed that flowers of *O. harringtonii* exclusively emit (R)-(-)-linalool (Fig. 1B).

Transcriptome sequencing, assembly, and annotation

RNA was successfully sequenced from six tissues (stamens, stigma/style, petals, hypanthium, bud, and leaf) for all individuals, except for individuals D and F, for which bud and leaf samples were not obtained (see Methods). Leaf tissues were included to ensure that we could detect differentially expressed genes involved in the biosynthesis of floral volatiles that were not constitutively expressed in vegetative tissues. Across all 32 samples, 1.57 billion paired reads were sequenced (Additional file 1). On

Table 1 Volatile floral terpenoids and their emission rates for greenhouse-grown plants (A-F) used for transcriptomics. Emission rates are given in µg per flower per hour. Volatile terpenoids are ordered by sub class (see Table S1) and retention time (min). The identity of all compounds except isophytol (*) and ocimene epoxide (*) was confirmed through co-chromatography and mass spectral comparison with synthetic standards

	Δ					
	Α	В	С	D	E	F
Monoterpenes						
β-myrcene	0.18	0.15	0.13	0.07	003	0.09
(Z)-β-ocimene	0.62	0.54	0.39	0.19	0.09	0.27
(E)-β-ocimene	27.50	22.49	23.26	14.08	9.28	19.67
Ocimene epoxide*	0.29	0.76	=	=	0.13	0.02
R-(-)-linalool	15.25	13.79	12.23	-	-	-
Diterpenes						
Isophytol*	0.04	0.08	=	=	=	=-
Sesquiterpenes						
β-caryophyllene	0.42	0.09	0.05	0.03	0.46	0.02
α-humulene	0.03	-	-	-	0.01	-
Methyl farnesoate	6.79	0.70	0.07	-	0.54	0.02
(E,E)-Farnesol	1.07	0.23	0.03	0.02	0.05	0.02

Bechen et al. BMC Genomics (2022) 23:124 Page 4 of 17

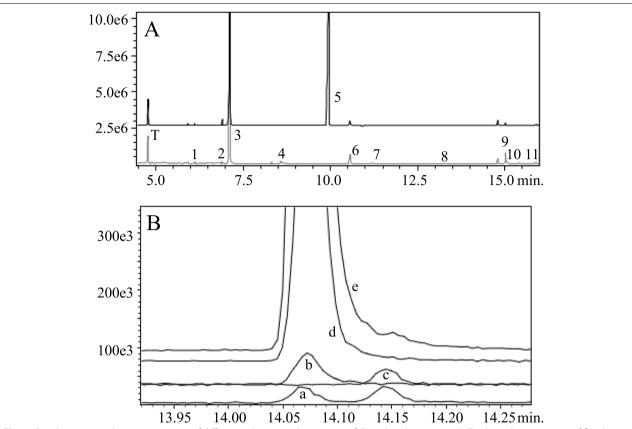


Fig. 1 Gas chromatographic representation of differences between chemotypes of *Oenothera harringtonii*. **A.** Total ion chromatogram of floral scent from two accessions, the upper trace (black) from a linalool+ plant and the lower trace (gray) from a plant lacking this compound. Other than the internal standard (toluene; T), numbered peaks indicate floral scent compounds (Monoterpenes: (1) β-myrcene, (2) (Z)-β-ocimene, (3) (E)-β-ocimene, (4) Ocimene epoxide, (5) R-(—)-linalool; Diterpenes: (10) Isophytol; Sesquiterpenes: (6) β-caryophyllene, (7) α-humulene, (8) Caryophyllene oxide, (9) Methyl farnesoate, (11) E,E-farnesol), with retention times given for a typical polar (EC-wax) GC column. **B.** Separation of linalool enantiomers on a chiral GC column, confirming that flowers of *O. harringtonii* exclusively emit (R)-(—)-linalool. Trace a = racemic (1:1) (R)-(—) and (S)-(+)-linalool, trace b = synthetic (R)-(—)-linalool, trace c = (S)-(+)-linalool in floral headspace of *Clarkia breweri*, trace d = floral headspace of*O. harringtonii*from Florence, Colorado (FLO), and trace <math>e is the same sample spiked with (R)-(—)-linalool. In both panels, vertical axis shows counts (abundance) and horizontal axis shows retention time (minutes)

average, 95.77% of reads passed quality trimming, and 99.04% of these high-quality reads were retained after filtering for plastid genes and rRNA. In total, 94.86%, or 1.49 billion reads, were retained after filtering. After normalization, a total of 33 million reads were assembled into a reference assembly consisting of 489,895 contigs and 244,284 components. Through alignment and abundance estimation using RSEM, 72% of cleaned reads aligned to the reference assembly. Median contig length was 393 base pairs, average contig length was 676.8 base pairs, and transcript N50 was 1047 base pairs. As determined using the Trinotate pipeline [46], 27.6% of contigs had either a blastx or blastp hit to Swiss-Prot, and 25.5% of contigs had a gene ontology term assigned from either blast or pfam. In a blastx search of the assembly against an Arabidopsis database [47], 174,068 contigs had a hit in the Arabidopsis thaliana protein database; 20,480 of

these were unique *Arabidopsis* protein hits. In a tBLASTn search of *Arabidopsis* proteins against the assembly, 31,064 *Arabidopsis* peptides had a hit and 14,614 of these were unique. In total, there were 11,754 reciprocal best hits between the transcriptome assembly and the *Arabidopsis* proteome, with an ortholog hit ratio of 0.34 and an average collapse factor of 2.13.

Differential expression and GO enrichment analysis

Principal components analysis was conducted to test whether it is appropriate to group biological replicates together during subsequent differential expression analysis. In general, samples of the same linalool chemotype grouped together, suggesting differences in gene expression between the chemotypes (Additional file 6). Additionally, samples clustered according to individual and tissue type. In total, edgeR identified 6577 differentially

Bechen et al. BMC Genomics (2022) 23:124 Page 5 of 17

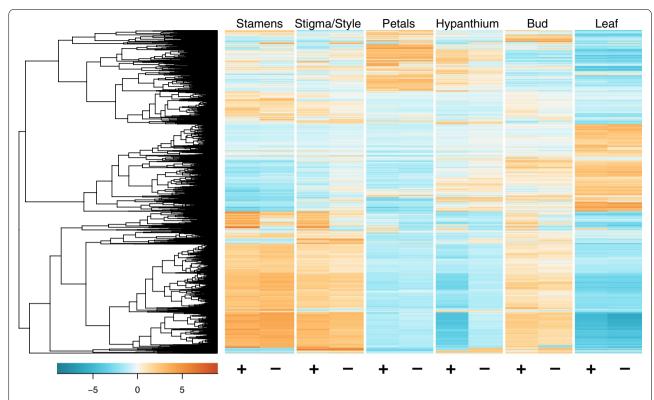


Fig. 2 Heatmap of Expression for all Differentially Expressed Genes. In total, 6577 genes were identified as differentially expressed. Pairwise comparisons between linalool+ and linalool- floral organs, among linalool- floral organs, and among linalool+ tissue types were conducted; a gene was considered differentially expressed if it had at least a four-fold change in expression and a *p*-value less than 0.001. Biological replicates are pooled together by tissue type and linalool emission (either + or -). Orange coloration indicates highly expressed genes and blue indicates lowly expressed genes on a centered log2 (fpkm + 1) scale. Genes are ordered by similarity of expression, as represented by the dendrogram on the left side of the heatmap

expressed genes (DEGs) among the six tissues and between linalool+ and linalool- individuals, with an overall pattern suggesting that tissue identity explains most of the observed differential expression (Fig. 2). All DEGs were grouped into 12 clusters by cutting the DEG dendrogram at 65% of its height (Fig. 3). Gene ontology (GO) enrichment analysis was performed for each cluster to identify categories of genes that are overrepresented (see Additional file 2 for a complete list of enriched GO terms for each cluster).

Of the twelve clusters, two (clusters 10 and 11) were characterized by differential expression of genes between linalool+ and linalool- individuals, suggesting that genes in these clusters may be involved in linalool biosynthesis. Genes in cluster 10 ($n\!=\!43$) were upregulated in all tissues from linalool+ individuals, whereas genes within cluster 11 ($n\!=\!46$) were downregulated in all tissues from linalool+ individuals. In general, both of these clusters were characterized by several genes that lack annotations in the Trinotate report (26/43 and 38/46 genes for each cluster, respectively), either because they are unique

or significantly differ from a homolog in the reference database.

To obtain an overview of the functions of genes within each cluster, we conducted GO enrichment. While these enrichment analyses may predict a possible function for these genes, we note that automatic annotation based on sequence homology is not proof of biological activity. Cluster 10 is enriched for terpene synthase activity (Table 2), and transcripts in this cluster with this higherlevel GO term (TPS activity) include those annotated as terpene synthase 10 (TRINITY_DN74292_c2_g1), γ -terpinene synthase/(+)- α -terpineol synthase (TRIN-ITY_DN62538_c3_g2) and santalene synthase (TRIN-ITY_DN76019_c5_g5). Terpene synthase 10 is known to produce (R)-(-)-linalool as a primary product in *Arabi*dopsis thaliana, with β -myrcene and (E)- β -ocimene as minor products [48]. γ -terpinene and (+)- α -terpineol are monoterpenes, and although santalene is a sesquiterpene, terpene synthases responsible for its biosynthesis are classified with the TPS-b monoterpene synthases [49]. y-terpinene and santalene are not present in the

Bechen et al. BMC Genomics (2022) 23:124 Page 6 of 17

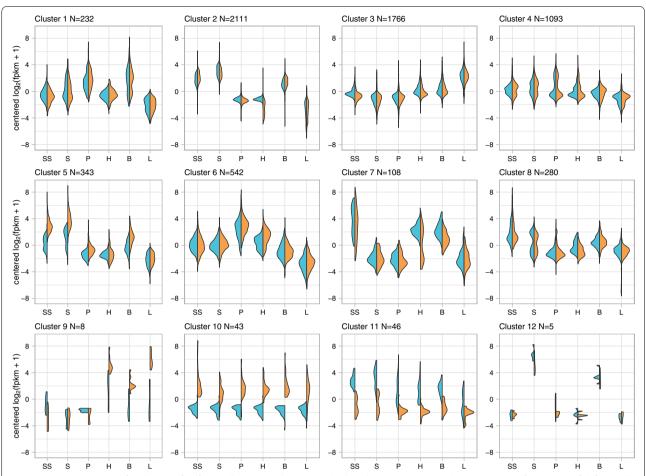


Fig. 3 Expression Patterns for Clusters of Differentially Expressed Genes. Each plot (cluster) represents relative expression for a group of differentially expressed genes with similar expression patterns, as defined by cutting the dendrogram in Fig. 2 at 65% of its height. Expression for each tissue type (SS = stigma and style, S = stamens, P = petals, H = hypanthium, B = bud, and L = leaf) is divided into expression for linalool- plants (left/blue) and linalool+ plants (right/orange)

floral scent of *O. harringtonii*, whereas α-terpineol is only present in small amounts, inconsistently, in some populations (e.g. FLO; Additional file 4). Thus, either the appropriate biosynthetic enzymes are not translated from these transcripts or, if they are, their eventual products are either metabolized into other secondary compounds, or they simply are not volatilized. However, we emphasize that this study was designed to predict genes involved only in (R)-(-)-linalool biosynthesis and emission, and that functional characterization of other TPS enzymes is required to validate their precise function and activity in O. harringtonii. Together, these results suggest that linalool+ individuals have the capacity to synthesize terpenes in all six tissues included here; therefore, differences between the linalool+ and linalool- chemotypes include terpene synthase expression in both floral and vegetative tissues. In addition to being common components of floral fragrance, terpenes are known to be involved in constitutive and induced defenses in both floral and non-floral tissues [4, 50]. Terpenes are also involved in indirect defense, as they can attract members of the third trophic level (e.g., predators of herbivores) [51–55]. Overexpression of TPS genes across all tissues including leaves suggests that *O. harringtonii* populations emitting R-(—)-linalool from flowers may also be better-defended.

Cluster 11 did not have any significant GO term enrichments, possibly because only a small number of the transcripts in the cluster were able to be annotated. The few genes in cluster 11 that do have annotations are not associated with terpene biosynthesis (Additional file 2). Two additional clusters contained significantly enriched GO terms related to terpene biosynthesis: clusters 1 (n=232) and 6 (n=542). Cluster 1 comprised genes upregulated in buds and petals but downregulated in leaves. Significant (FDR>0.05) GO term enrichments for this cluster include isoprenoid biosynthetic process, terpenoid

Bechen *et al. BMC Genomics* (2022) 23:124 Page 7 of 17

Table 2 GO Enrichments for each cluster. Top five significant enrichments (FDR > 0.05) for each cluster are shown. Note that clusters 5, 10, 11, and 12 had fewer than five significant enrichments. Full list of enriched GO terms can be found in Additional file 2

Cluster	GO Term ID	Ontology	GO Term		
1	GO:0008610	ВР	lipid biosynthetic process	1.68E-09	
1	GO:0044255	BP	cellular lipid metabolic process	1.14E-08	
1	GO:0008299	BP	isoprenoid biosynthetic process	1.85E-07	
1	GO:0019288	BP	isopentenyl diphosphate biosynthetic process, methylerythritol 4-phosphate pathway	1.91E-07	
1	GO:0046577	MF	long-chain-alcohol oxidase activity	2.69E-07	
2	GO:0030599	MF	pectin esterase activity	9.04E-66	
2	GO:0045490	BP	pectin catabolic process	1.56E-60	
2	GO:0045330	MF	aspartyl esterase activity	1.92E-56	
2	GO:0010393	BP	galacturonan metabolic process	1.30E-50	
2	GO:0045488	BP	pectin metabolic process	1.30E-50	
3	GO:0044435	CC	plastid part	7.58E-70	
3	GO:0044434	CC	chloroplast part	7.58E-70	
3	GO:0009579	CC	thylakoid	2.78E-62	
3	GO:0044436	CC	thylakoid part	5.12E-53	
3	GO:0009507	CC	chloroplast	1.85E-51	
4	GO:0016054	BP	organic acid catabolic process	3.47E-09	
4	GO:0046395	BP	carboxylic acid catabolic process	3.47E-09	
4	GO:0009702	MF	L-arabinokinase activity	1.46E-08	
4	GO:0044282	BP	small molecule catabolic process	1.64E-07	
4	GO:1901606	BP	alpha-amino acid catabolic process	9.71E-07	
5	20.1701000	5.	no significant terms	3., 12 0,	
6	GO:0010333	MF	terpene synthase activity	4.03E-10	
6	GO:0016838	MF	carbon-oxygen lyase activity, acting on phosphates	1.00E-09	
6	GO:0010279	MF	indole-3-acetic acid amido synthetase activity	5.93E-08	
6	GO:0010334	MF	sesquiterpene synthase activity	2.57E-06	
6	GO:0008152	BP	metabolic process	1.17E-05	
7	GO:0005576	CC	extracellular region	3.96E-05	
, 7	GO:0000272	BP	polysaccharide catabolic process	8.36E-05	
7	GO:0045490	ВР	personal per	1.13E-04	
7	GO:0010393	ВР		1.13E-04 1.45E-03	
	GO:0010393 GO:0045488	ВР	galacturonan metabolic process	1.45E-03	
7			pectin metabolic process		
8	GO:0080054	MF	low-affinity nitrate transmembrane transporter activity	2.18E-04	
8	GO:0080055	BP	low-affinity nitrate transport	2.18E-04	
8	GO:0015706	BP	nitrate transport	7.68E-02	
8	GO:0015112	MF	nitrate transmembrane transporter activity	7.68E-02	
8	GO:0015833	BP	peptide transport	7.68E-02	
9	GO:0000272	BP	polysaccharide catabolic process	0	
9	GO:0004553	MF	hydrolase activity, hydrolyzing O-glycosyl compounds	0	
9	GO:0004568	MF	chitinase activity	0	
9	GO:0005976	BP	polysaccharide metabolic process	0	
9	GO:0006022	BP	aminoglycan metabolic process	0	
10	GO:0010333	MF	terpene synthase activity	1.83E-02	
10	GO:0016838	MF	carbon-oxygen lyase activity, acting on phosphates	1.83E-02	
11			no significant terms		
12	GO:0006869	BP	lipid transport	2.77E-02	

Bechen et al. BMC Genomics (2022) 23:124 Page 8 of 17

biosynthetic process, and isopentenyl diphosphate biosynthetic process, among others (Table 2 and Additional file 2). Cluster 6 comprised genes upregulated in petals and downregulated in leaves. Significant GO term enrichments for this cluster include terpene synthase activity, sesquiterpene synthase activity, isoprenoid biosynthetic process, and terpenoid biosynthetic process (Table 2 and Additional file 2). Neither cluster showed substantial differentiation between the two linalool chemotypes, which, in combination with the enriched GO terms for each cluster, is an indication that the genes contained within those clusters may be involved in the biosynthesis of floral scent volatiles that are shared between the two chemotypes. Thus, the expression patterns of these two clusters show that certain terpenoid scent compounds are likely to be produced primarily in the petals of O. harringtonii, and that buds may be synthesizing floral scent or floral scent precursors 24–48 h prior to anthesis.

Phylogenomic analysis of Terpene synthases and (R)-(-)-linalool polymorphisms

To further characterize and identify terpene synthases in the transcriptome, regardless of their expression pattern, a profile Hidden Markov Model (pHMM) for terpene synthase (TPS) proteins was created based on a multiple sequence alignment of TPS sequences from van Schie et al. [23]. The pHMM successfully identified 40 TPS inferred protein sequences in the *O. harringtonii* reference assembly (Fig. 4). While it is likely that this is an overestimate due to the co-assembly of multiple individuals for the reference transcriptome, the 40 sequences were successfully placed into five of the seven TPS subfamilies with high confidence. According to the TPS subfamily circumscription in van Schie et al. [23], we found: (1) two distinct sequences of diterpene synthases (TPSc); (2) a single sequence of (S)-(+)-linalool synthase (TPSf); (3) 11 sequences of a second group of diterpene synthases (TPSe) with seven distinct groups of genes (components arising from the Trinity assembly); (4) eight sequences of sesquiterpene synthases (TPSa) with six distinct components, and (5) 18 sequences of monoterpene synthases (TPSb). No sequences were reconstructed within the TPSd or TPSg subfamilies (Fig. 5); the former (TPSd) comprises exclusively gymnosperm terpene synthases and the latter (TPSg) comprises a group of acyclic monoterpene synthases related to ocimene synthases in Antirrhinum [23].

Genes belonging to TPSc, TPSe, and TPSf largely showed no differential expression between either tissue or chemotype (Fig. 4). Two genes within the TPSe clade belong to DEG cluster 3 (Figs. 3 and 4) and were upregulated in leaves, suggesting that they may play a role in defense against herbivory rather than floral fragrance.

Some sesquiterpene synthase genes (the TPSa clade) were upregulated in floral tissues of linalool+ individuals (see cluster 6 in Figs. 3 and 4); however, these genes were highly expressed in the petals of both linalool+ and linalool- individuals. This matches fragrance data collected from source populations; both linalool+ and linalool-populations of *O. harringtonii* emit a range of sesquiterpenes that include β -caryophyllene, α -humulene, α - and β -farnesenes (Additional file 4); however, whether these transcripts represent enzymes that are directly involved in sesquiterpene biosynthesis requires functional characterization in vitro and in vivo, rather than simply phylogenomic-based annotation.

To-date, the most intensive genetic and physiological study of floral fragrance emission in Onagraceae has focused on a pair of sibling species in the genus Clarkia [42, 43, 56, 57]. Most Clarkia species are bee-pollinated or autogamous [58], and range from unscented to mildly scented, with the exception of C. breweri, which produces a strong floral fragrance rich in (S)-(+)-linalool as a derived trait associated with a shift to hawkmoth pollination [57]. Pichersky et al. [56] found that (S)-(+)-linalool is primarily emitted from the petals and, to a lesser extent, the pistil of C. breweri flowers, whereas comparative analyses of the closest relative, C. concinna, revealed linalool production only in stigmatic tissues. The authors inferred that increased levels of linalool synthase (LIS) gene expression, expansion of tissues in which it is expressed, and enzymatic upregulation all contributed to the evolutionary gain-of-function of strong (S)-(+)-linalool emission from the flowers of *C. breweri* [29]. Our phylogenomic analysis placed a single sequence of (S)-(+)-linalool synthase (TPSf) from O. harringtonii as sister to (S)-(+)-linalool synthase from *Clarkia* (Fig. 4). While we cannot confirm that this putative (S)-(+) -linalool synthase in O. harringtonii is non-functional, it is clear that no detectable (S)-(+)-linalool is emitted from the flowers (Fig. 1B; Table 1), the transcript is not differentially expressed, and it is expressed at a low level.

The *O. harringtonii* genes circumscribed as belonging to the TPSb (monoterpene synthases) clade can be divided into two subclades, annotated here as TPSb¹ and TPSb² (Fig. 4). While both clades are strongly supported, their relationships to TPSb genes from other species are not well resolved. Genes from *O. harringtonii* within the TPSb¹ clade show some evidence of upregulation in floral tissues and bud (clusters 1 and 6) with no evidence of chemotype-related differential expression. As the two chemotypes differ primarily in the presence of a single monoterpene, (R)-(-)-linalool, we would expect that only one of the TPSb subclades would include a gene that is upregulated in linalool+ floral tissues. Two contigs from clade TPSb² belong to cluster 10, which showed

Bechen et al. BMC Genomics (2022) 23:124 Page 9 of 17

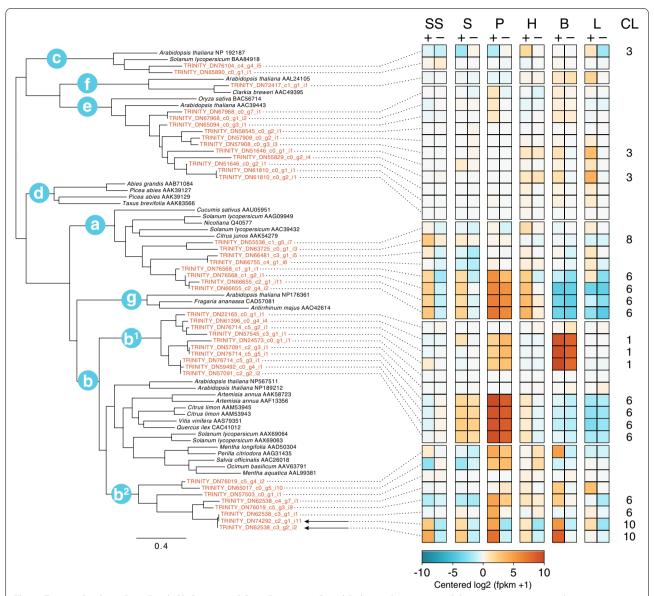


Fig. 4 Terpene Synthase Gene Family Phylogeny and Gene Expression. Gene labels in red are putative O. harringtonii terpene synthases as identified by a pHMM (labeled with TRINITY) based on sequences from van Shie et al. 2007, which are shown in black. The seven TPS subfamilies a-g are indicated on the tree; note that O. harringtonii transcripts fall into two clades within subfamily D, represented by D and D. All TPS subfamilies are supported by D and D and D and D and D are subfamilies are supported by D and D and D are subfamilies are supported by D and D are subfamilies are subfamilies are supported by D and D are subfamilies are subfamilies are supported by D and D are subfamilies are subfamilies are subfamilies are supported by D and D are subfamilies are subfamil

strong differential expression related to chemotype (see rows annotated as cluster 10 in Fig. 4). Although cluster 10 includes genes that are differentially expressed (upregulated in linalool+ individuals) for all tissues including leaves, the signal for upregulation of these two transcripts in leaves is relatively weak. In fact, we detect no (R)-(-)-linalool emitted from the leaves of individuals with linalool+ flowers (Additional file 3). The strongest signal of upregulation is detected from petal tissue; floral

organ-specific emission data confirms that the whole-flower emission of (R)-(-)-linalool is driven largely by petal tissue (Additional file 9). Furthermore, the TPSb² subclade is sister (with moderate bootstrap support of 68) to a clade that includes other linalool synthases, including the (R)-(-)-linalool synthase gene from *Artemesia annua* [59]. When the phylogeny, differential expression, and floral fragrance data are taken together, they strongly suggest that the two transcripts belonging to

Bechen et al. BMC Genomics (2022) 23:124 Page 10 of 17

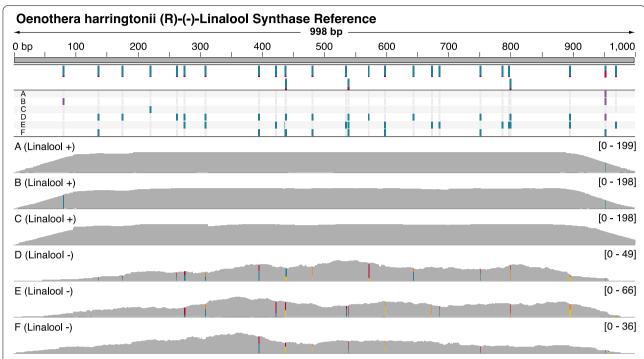


Fig. 5 Distribution of polymorphic sites relative to a reconstructed (R)-(—)-Linalool Synthase reference gene. Top: Reference sequence and locations of SNPs passing quality filters. Proportion of color in each bar indicates allele frequencies across the six individuals of *Oenothera harringtonii*. Middle: SNP calls passing filters for six individuals of *Oenothera harringtonii* relative to the reference sequence. Bottom: Depth of sequencing across the reference sequence for each individual (range of depth indicated to the right). Colors indicate presence of heterozygosity. Only deduplicated transcriptome reads were used for this analysis

cluster 10 in clade $TPSb^2$ are (R)-(-)-linalool synthases in *O. harringtonii*. However, while this provides strong circumstantial evidence, further studies are required to verify their function .

Accounting for possible transcriptome assembly artifacts, we examined the three transcripts from the clade containing the candidate (R)-(-)-linalool synthases TRINITY_DN62538_ (TRINITY_DN62538_c3_g1_i1, c3_g2_i2, and TRINITY_DN74292_c2_g1_i11) determined that they each represent a partial coding sequence; the three transcripts were subsequently merged to form a putative full-length transcript. A BLAST search of the merged transcript revealed sequence similarity to (R)-(-)-linalool synthase in lemon myrtle, *Backhousia* citriodora (Myrtaceae; GenBank accession AB438045.1). However, the O. harringtonii transcript could only be aligned over 52% of the lemon myrtle transcript indicating that the merged *O. harringtonii* transcript may either not represent a full-length transcript, is shorter than the coding sequence in B. citriodora, or is significantly diverged in sequence (sequence similarity to the *B. citrio*dora CDS is 64%). A full-length protein sequence annotated from a 13kb genomic contig (Additional file 7), when aligned with the B. citriodora sequence (Additional file 8), shows that there is significant divergence at the 5' end that likely accounts for this discrepancy. As RNA-Seq has been shown to reliably predict genes that are significantly associated with a treatment [60–63] and given the overwhelming difference between the abundance of reads mapped to the candidate (R)-(-)-linalool synthase transcripts in linalool+ and linalool- individuals, we suggest that RT-qPCR validation is unnecessary in this case. Future studies that focus exclusively on the function of this particular gene in *Oenothera* in more detail may benefit from the sequences described here, as a template for primer design or as a candidate locus in association studies.

To investigate if there are differences in the coding region of (R)-(-)-linalool synthase associated with either chemotype, we compared SNPs between individuals. Calling SNPs for each individual revealed that all linalool+ individuals are homozygous and share the same haplotype which matched the reference (merged consensus) sequence, with the exception of two SNPs at the 5′ and 3′ ends of the coding region (Fig. 5), which may be due to sequencing or assembly error (regions where read depth decreases). Conversely, all linalool- individuals are heterozygous, and do not share the same haplotype as each other or the linalool+ individuals. Due to the high level of (R)-(-)-linalool synthase expression

Bechen et al. BMC Genomics (2022) 23:124 Page 11 of 17

in linalool+ plants, the sequencing depth for linalool+ individuals appears to be equal in Fig. 5, likely an artifact of using deduplicated reads. As expression is low in the linalool- plants, the deduplication process likely removed few, if any, reads, reflected in the varying depths of coverage for these individuals (Fig. 5). Sequences reconstructed from the linalool- individuals are characterized by between eight and fifteen SNPs compared to the reference sequence. The presence of a single allele in all linalool+ individuals included here is suggestive of a selective sweep in populations dominated by linalool+ plants, but much more extensive sampling of individuals and genomic regions is needed to better characterize the history of selection. Phasing of the alleles for linaloolindividuals, and a reconstruction of the terpene synthase gene tree with additional sequences added (Additional file 5) confirmed that the sequences were indeed alleles rather than paralogs.

Terpenes are known to be regulated both transcriptionally and post-transcriptionally. In Arabidopsis, for example, differences in the amount of (E)- β -ocimene and (E,E)- α -farnesene emitted between two ecotypes is controlled by allelic variation of two terpene synthase genes, whereby one of the two genes in each ecotype produces a non-functional transcript [64]. Transcription factors regulating a variety of terpenes have also been identified; in cotton WRKY1 positively regulates (+)-δ-cadinene synthase (CAD1) [65], and in kiwifruit, NAC transcription factors were found to regulate the expression of TPS1 in ripe fruit [66]. Post-transcriptional regulation includes the action of miRNAs, which have been identified in plants such as Ocimum basilicum [67] and Ferula gummosa [68]. The existence of SNPs between transcripts from each chemotype may suggest differences in functionality of each linalool synthase; however, few of the SNPs are shared among linalool- plants, such that the regulation of (R)-(-)-linalool synthase in *O. harringtonii* may be associated only with upregulation and the allele found in linalool+ individuals. Further sequence analysis and more extensive sampling is required to determine whether this apparent allelic diversity shows strong evidence of population structure. Additionally, a highquality draft genome sequence for O. harringtonii would allow us to better detect variation that may be associated with regulatory regions or copy number variation.

Conclusions

This study presents the first transcriptome assembly and analysis of differential expression in *Oenothera harringtonii*, a species with intraspecific variation for the emission of (R)-(-)-linalool in its floral fragrance. In this study, RNA-Seq was used to compare transcriptomes of six different *Oenothera harringtonii* tissues from six

individuals (three linalool+, three linalool-). Six thousand five hundred seventy-seven differentially expressed genes were identified, and these DEGs were sorted into 12 clusters. Three clusters were significantly enriched for GO terms related to floral fragrance biosynthesis. Two of these clusters showed upregulation in petals, suggesting that floral scent biosynthesis is mostly localized to petals, a result that was confirmed by measuring tissuespecific emission patterns (Additional file 9). The third cluster showed upregulation in all linalool+ tissues and contained a significantly enriched GO term for terpene synthase. A phylogenetic analysis of all terpene synthases identified using a profile Hidden Markov Model classified 40 O. harringtonii transcripts into five terpene synthase subfamilies. Synthesizing the phylogenetic, differential expression, and floral fragrance data, we identified a transcript that likely encodes a partial (R)-(-)-linalool synthase, representing the first in silico identification of a candidate (R)-(-)-linalool synthase gene in the flowering plant family Onagraceae.

Methods

Plant material

Parental individuals were grown from seed collected in natural populations of Oenothera harringtonii from southeastern Colorado for which floral volatile data (Additional file 4) indicated that floral scent was polymorphic among the sampled populations: Burnt Mill Road (Pueblo County; linalool+), Florence (Fremont County; linalool+), Bloom (Las Animas County; linalool-), and David Canyon (Otero County; linalool-) (see [69] for locality data). As part of ongoing work on this species, the following controlled crosses within chemotype were conducted in the greenhouse at the Chicago Botanic Garden (Glencoe, Illinois, USA) in 2008 and 2009: both parents from Burnt Mill Road (individuals A and B), both parents from Florence (individual C), one parent from David Canyon and the other from Bloom (individual D), and both parents from David Canyon (individuals E and F). The resultant offspring seeds were germinated and grown in the greenhouse until buds were initiated, after which they were moved to a growth chamber (Conviron model GR48, Winnipeg, MB, Canada) where they typically flowered within 1 week. While anthesis in natural populations occurs at dusk [69], to facilitate daytime floral fragrance sampling, the growth chamber settings were configured such that dusk began at 9:30, night was from 11:00 to 20:30, dawn began at 20:30, and daytime was from 21:30 to 9:30.

Floral fragrance collection

Based on hundreds of previous analyses of floral scent from across the range of *O. harringtonii* (Additional

Bechen et al. BMC Genomics (2022) 23:124 Page 12 of 17

file 4), the population-level chemotypes are stable and consistent; floral scent analyses of the plants grown for this transcriptomic study were carried out to confirm the prediction of chemotypes for the plant material selected for RNA-Seq. Floral fragrance was collected prior to RNA extraction to verify the linalool chemotype (linalool+ or linalool-) of each of the six individuals. Each flower was enclosed in a nylon resin oven bag (Reynolds, Lake Forest, IL) that was cut to $20.3 \, \text{cm} \times 14.8 \, \text{cm}$ and resealed. Filters, constructed from a glass Pasteur pipette containing 10 mg of adsorbent material (Porapak Q 80/100 mesh size, Sigma-Aldrich, St. Louis, MO) tamped between quartz wool, were used to trap floral volatiles during the first hour after anthesis at dusk. The bag was secured around the flower's hypanthium and the filter with twist-ties, ensuring that there were no vegetative structures enclosed within the bag. The filter tip was positioned as close as possible to the floral center without damaging it and attached via Teflon tubing to a vacuum pump (PAS-500, Spectrex, Redwood City, CA). Pumps were run at a flow rate of 200 ml air per minute for 1 h; filters were then eluted with 200 µl of high purity hexane (GC2, Burdick & Jackson, Muskegon, MI). Two types of controls were used for each floral fragrance collection: an ambient control filter attached to a bag without a flower, and a clean storage control filter that was eluted without having been used for fragrance collection. Eluted samples were stored at -20° C prior to being analyzed using gas chromatography-mass spectrometry (GC-MS) at Cornell University.

Floral scent analysis by GC-MS

Prior to analysis, hexane-eluted floral headspace samples were concentrated to a uniform volume of 50 µl using gaseous N_2 , and $5 \mu l$ of 0.03% toluene in hexane (23 ng) was added as an internal standard. One µl aliquots of each sample were injected into a Shimadzu GC-17A gas chromatograph equipped with a Shimadzu QP5000 quadrupole electron ionization (EI) mass spectrometer (Shimadzu Scientific Instruments, Columbia, MD) as a detector. All analyses were made using splitless injections on a polar GC column (0.25 mm diameter, 30 m length, 0.25 µm film thickness; EC WAX; W.R. Grace & Co., Columbia, MD) using ultra high purity (99.999%) helium as a mobile phase (split ratio 12:1, constant flow of 1 ml/ min). The gas chromatograph temperature and pressure parameters were optimized to resolve linalool and other floral volatiles to baseline with a total run time of 19 min per sample (240°C injection port temperature, 260°C detector temperature, 40 °C initial temperature, two-min hold time increased at 15 °C per min to 260 °C, hold time 2.38 min). EI mass spectra (70 eV) were collected from m/z 40–350 (daltons) at a detector voltage of 70 eV, with scan speed of 1000 and a scan interval of 0.29 s.

Volatile compounds were tentatively identified using computerized mass spectral libraries (Wiley Registry of Mass Spectral Data, National Institute of Standards and Technology, and [70] (>120,000 mass spectra)). Peak areas were integrated using Shimadzu's GCMSsolutions software and normalized for slight differences in final sample volume using the internal standard. Peak areas were quantified by comparison with five-point (log scale) dose-response standard curves generated using serial dilutions from 1 to 0.0001 mg/ml of authentic standards for (E)- β -ocimene, racemic linalool, β -caryophyllene, geraniol, and (E,E)-farnesol. Emission rates were expressed as ng per flower, per hour (Table 1).

Additional chromatographic analyses were performed to determine which of the two known enantiomers of linalool is present in the floral headspace of Oenothera harringtonii. The third carbon of linalool (3,7-dimethylocta-1,6-dien-3-ol; C₁₀H₁₈O) is a chiral center, and both (S)-(+) and (R)-(-) enantiomers may be present in floral volatile blends [29, 71]. A chiral GC column (Cyclosil-B, Agilent Technologies, Inc.; 30 m long, 0.25 mm inner diameter, 0.25um film thickness) was used with the following temperature program: splitless injection at 240 °C, column temperature increase from 40 to 240°C at 10°C per min. Under these conditions, the (R)-(-) and (S)-(+)enantiomers of linalool were distinguished by co-injection of two authentic standards, racemic linalool (Aldrich L260-2) and (R)-(-)-linalool (Aldrich 62,139), along with a one-hour headspace sample taken from a single flower of Clarkia breweri, previously shown to exclusively emit (S)-(+)-linalool [72]. Floral headspace samples from linalool+ populations of O. harringtonii (Florence) were chromatographed using the same protocol, comparing retention times for the leading edge of the linalool peak with those of the authentic standards.

RNA extraction

RNA was extracted from the same flowers used in fragrance analysis. While still attached to the plant, each flower was dissected into four parts: (1) stamens, (2) petals, (3) stigma and style, and (4) hypanthium and sepals. Additionally, RNA was extracted from flower buds 24–48 h before anthesis and from young leaf tissues from the center of the rosette (excluding individuals D and F, two linalool- individuals for which bud and leaf samples could not be obtained due to insufficient growth post initial sampling). After tissues were excised from the plant, they were immediately placed into either 15 ml conical tubes (petals, hypanthium, bud) or 2 ml microcentrifuge tubes (stigma and style, stamens, leaf) and submerged in liquid nitrogen.

Bechen et al. BMC Genomics (2022) 23:124 Page 13 of 17

Frozen tissue was ground into a fine powder using either a mortar and pestle (petals, hypanthium, bud) or tissue homogenizer with a 3 mm stainless steel ball bearing inside the microcentrifuge tube (stigma and style, stamens, leaf; Talboys High Throughput Homogenizer 930,145, Troemner, Thorofare, NJ). RNA extraction was carried out with the Spectrum Plant Total RNA Mini Kit (Sigma-Aldrich, St. Louis, MO) or the RNeasy Mini Kit (Qiagen, Hilden, Germany), with an optional second elution to yield a total of $100\,\mu l$ of eluate. The amount of resulting RNA was quantified with a Qubit 2.0 fluorometer (Invitrogen, Carlsbad, CA) using the RNA Broad-Range Assay Kit (Invitrogen, Carlsbad, CA). All RNA samples were stored at $-80\,^{\circ}C$.

Sequencing and Transcriptome assembly

Sequencing of samples was conducted by the University of Chicago Genomics core using an Illumina HiSeq2500 (Illumina, San Diego, CA) with paired-end 100 base pair reads. All sequences were evaluated for quality using FastQC v0.10.1 [73]. Adapters and reads with low quality scores were trimmed from the readset with Trimmomatic v0.30 (java -jar trimmomatic.jar PE - phred33 input_ read1.fq.gz input_read2.fq.gz output_read1_paired.fq.gz output_read1_unpaired.fq.gz output_read2_paired.fq.gz output_read2_unpaired.fq.gz ILLUMINACLIP:TruSeq3-PE.fa:2:30:10 LEADING:3 TRAILING:3 SLIDINGWIN-DOW:4:15 MINLEN:36) [74]. Reads that were likely rRNA or plastid RNA were removed by aligning all reads against a database of Oenothera plastid genes and O. harringtonii rRNA transcripts using bowtie2 v2.2.6 (bowtie2 --un conc gz filtered reads --no-unal -x rRNAplastomedb - 1 output_read1_paired.fq.gz - 2 output_read2_ paired.fq.gz -S aligned_reads.sam) [75]. This database was created by combining an Oenothera plastid database (NCBI accession numbers EU262887, EU262889, EU262890, EU262891, KT881170, KT881173, KT881176) with a database of rRNA transcripts identified with RNAmmer v1.2 [76] from a pre-existing O. harringtonii seedling transcriptome and confirming with an NCBI BLAST search (blastn, nucleotide collection database). All reads were pooled together and normalized as a single readset using the in silico read normalization strategy from Trinity r2014-07-17 [77, 78] with a maximum coverage setting of 50 (Trinity/util/insilico_read_normalization.pl --seqType fq --JM 100G --max_cov 50 --left_list readlist_1.txt --right_list readlist_2.txt --pairs_together --output outputdirectory -- CPU 20). Normalized reads were assembled using Trinity [77, 78] with default settings (Trinity --seqType fq --max_memory 100G --left left.norm.fq --right right.norm.fq --CPU 15 --output trinity assembly).

Assembly quality was evaluated using several different metrics. Percent of reads mapped to the assembly using bowtie2 v2.2.6 [75] was compared across all samples to ensure that reads mapped back evenly across all individuals and tissue types. Mean contig length, median contig length, and contig N50 were calculated using the "TrinityStats.pl" script provided with Trinity (Trinity/util/TrinityStats.pl Trinity.fasta). Annotation statistics were calculated according to O'Neil and Emrich [79], including the number of hits and unique hits in a BLASTx and tBLASTn (v2.2.30) search to the Arabidopsis thaliana proteome, number of reciprocal best hits, average ortholog hit ratio, and average collapse factor (blastx -query Trinity.fasta -db arabidopsis_prot_db -num_threads 20 -outfmt 6 -max_target_seqs 1 -evalue 1e-6 > blastx.results; tblastn -query arabidopsis_prot.fa -db trinity_db -num_threads 20 -outfmt 6 -max_target_ segs 1 -evalue 1e-6 > tblastn.results).

Functional annotation

Assembled transcripts were annotated for inferred function using the Trinotate r2014-07-08 pipeline [46], which generates an SQlite database containing several types of functional annotations. These include sequence homology comparisons from BLAST+ v2.2.30 [80] and Swiss-Prot [81] (blastx -query Trinity.fasta -db uniprot_sprot. pep -max_target_seqs 1 -outfmt 6>blastx.results \ blastp -query transdecoder.pep -db uniprot_sprot.pep -num_threads 20 -max_target_seqs 1 -outfmt 6> blastp. results), protein domain identification from HMMER v2.3.2 [82] and PFAM [83] (Hmmscan --domtblout TrinotatePFAM.out Pfam-A.hmm transdecoder.pep>pfam. log), protein signal peptide identification from signalP v4.1 [84] (signal -f short -n signal.out transdecoder.peep), and transmembrane domain prediction from TmHMM v2.0c [85] (tmhmm -short < transdecoder.pep > tmhmm. out) and comparisons to several functional annotation databases including eggNOG [86], GO [87], and KEGG [88]. Protein sequences for these comparisons were predicted using TransDecoder r2014-07-04 (https://github. com/TransDecoder/TransDecoder/wiki; Trinity/trinity-plugins/transdecoder/Transdecoder -t Trinity.fasta --search_pfam Pfam-AB.hmm.bin --CPU 20). All results were loaded into the Trinotate SQlite database and an annotation report was generated with a cut-off e-value of 1e-9 (Trinotate sqlite.db report -E 1e-9 > annotation_ report.xls).

Differential expression analysis

Differential expression analysis followed the protocol recommended by Trinity [77, 78] and scripts provided with Trinity; these scripts use R v3.3.0 [89] and several R packages (edgeR v3.12.0, Biobase v2.30.0, gplots v3.0.1,

Bechen et al. BMC Genomics (2022) 23:124 Page 14 of 17

ape v3.4, qvalue v2.2.2, and goseq v1.22.0). The reads in each sample were mapped to the assembled contigs to determine gene expression levels using RSEM v1.2.15 (Trinity/util/align_and_estimate_abundance.pl --transcripts Trinity.fasta --seqType fq --left filtered_ reads_1P.fq --right filtered_reads_2P.fq --est_method RSEM --ouput_dir sample1 --aln_method bowtie --trinity mode \ Trinity/util/abundance estimates to matrix. pl --est_method RSEM --name_sample_by_basedir --out_prefix expression.genes sample1/RSEM.genes. results ... sample32/RSEM.genes.results). Biological replicates were evaluated using principal components analysis (Trinity/Analysis/DifferentialExpression/PtR --matrix expression.genes.counts.matrix -s samples.txt --log2 --prin_comp 3).

Differentially expressed genes (DEGs) were identified with the R package edgeR v3.12.0 [91, 92]. In this analysis, there were six tissue types (petals; stigma and style; stamens; hypanthium and sepals; leaf; bud), two conditions (linalool+ and linalool-), and three biological replicates (excluding leaf and bud samples for linalool-, which only had one biological replicate). Pairwise comparisons between linalool+ and linalool- floral organs, among linalool- floral organs, and among linalool+ tissue types were conducted; a gene was considered differentially expressed if it had at least a four-fold change in expression and a p-value less than 0.001 (Trinity/Analysis/DifferentialExpression/run DE analysis.pl expression.genes.counts.matrix --method edgeR --samples_file samples.txt --contrasts.txt). This approach captures differences between floral organ expression and chemotype expression while minimizing the number of DEGs extracted that are not involved in floral fragrance biosynthesis. A heatmap of all DEGs, with biological replicates averaged, was generated (Trinity/Analysis/ DifferentialExpression/replicates_to_sample_averages_ matrix.pl --matrix expression.genes.TMM.EXPR.matrix --samples_file samples.txt \ Trinity/Analysis/DifferentialExpression/analyze_diff_expr.pl --matrix expression_ avg_reps.genes.TMM.EXPR.matrix --samples samples. txt) and clusters of DEGs with a similar expression pattern were created by cutting the DEG dendrogram at 65% of its height (Trinity/Analysis/DifferentialExpression/ define_clusters_by_cutting_tree.pl --Ptree 65 -R avg_ reps.genes.matrix.Rdata).

GO enrichment analysis and Terpene biosynthesis gene identification

Gene ontology (GO) enrichment analysis, performed with scripts provided in the Trinity software package, was used to identify gene categories that are overrepresented in each cluster relative to the assembly (Trinotate/util/extract_GO_assignments_from_Trinotate_xls.

pl --Trinotate_xls annotation_report.xls -G --include_ ancestral_terms > go_annotations.txt \ Trinity/Analysis/ --factor_labeling DifferentialExpression/run_GOseq.pl factor_labeling.txt --GO assignments go_annotations.txt --lengths gene.lengths.txt). Phylogenetic inference was used to identify and classify terpene synthases (TPS) in the reference transcriptome assembly. To classify putative terpene synthases into the seven described subfamilies a-f [23, 42, 93, 94], all of the sequences included in van Schie et al. [23] were downloaded and verified by reproducing a tree that circumscribed the seven TPS subfamilies. The verified alignment was then used to create a profile Hidden Markov Model using HMMER v3.1b (hmmer.org). The O. harringtonii reference assembly was searched for sequences explained by the pHMM using hmmscan (e-value 1e-10). All putative terpene synthesis protein sequences were aligned using MAFFT v7.310 [95] (--maxiterate 1000 --localpair), and a phylogeny was inferred using RAxML v8.2.11 [96] with the PROT-GAMMAWAG model of sequence evolution and 100 fast bootstrap replicates.

SNP analysis

To determine the distribution of SNPs in the putative (R)-(-)-linalool synthase coding sequence, a putative full length transcript was created by merging partial transcripts identified by the phylogenetic and DEG analyses. Three transcripts were merged that formed a clade (TRINITY_DN62538_c3_g1_i1, TRINITY_DN62538_ c3_g2_i2, and TRINITY_DN74292_c2_g1_i11) and could be aligned with only a single mismatch. A web BLAST search against the GenBank database of nonredundant proteins resulted in alignment over approximately 52% of the length of (R)-(-)-linalool synthase from the lemon myrtle Backhousia citriodora (Myrtaceae), suggesting that the consensus sequence produced by merging the transcripts may not represent a full length transcript of (R)-(-)-linalool synthase. However, the merged *O. harringtonii* (R)-(-)-linalool synthase transcript and the lemon myrtle transcript (GenBank accession AB438045) were only 64% identical. SNPs were then identified by mapping reads to the merged transcript from each RNA-Seq library. All reads identified in the DEG analysis as mapping to the three unmerged transcripts were extracted and variants were discovered using the GATK best practices workflow for germline SNPs (https://software.broadinstitute.org/gatk/ best-practices/workflow?id=11145). Briefly, reads were re-mapped to the merged transcript and duplicate mappings were marked and removed before variants were called using HaplotypeCaller in GATK. Phasing of alleles within individuals was done with WhatsHap [97], after which two alternate phased haplotypes were extracted

Bechen et al. BMC Genomics (2022) 23:124 Page 15 of 17

using bcftools (https://samtools.github.io/bcftools/). Each of the phased allele sequences, along with several linalool synthase accessions from the web BLAST search, were added to the previously generated alignment of terpene synthase sequences using the --add-alignment feature in MAFFT. A new gene family phylogeny was generated using RAxML as previously described.

Abbreviations

DEG: Differentially expressed genes; FDR: False discovery rate; GC-MS: Gas chromatography-mass spectrometry; GO: Gene ontology; LIS: Linalool synthase; PC: Principal component; TPS: Terpene synthase; pHMM: Profile Hidden Markov Model

Supplementary Information

The online version contains supplementary material available at https://doi.org/10.1186/s12864-022-08370-6.

Additional file 1. Number of raw and clean paired reads per sample, and SRA BioSample IDs.

Additional file 2. All GO term enrichments for each cluster of differentially expressed genes.

Additional file 3. GC-MS evidence for the absence of constitutive volatile terpenoid emissions from the leaves of Oenothera harringtonii. Panel A: Total ion chromatograms comparing floral headspace (upper trace, blue) with two samples taken from non-blooming vegetative rosettes (middle and lower traces, red and black) of O. harringtonii from a population (Florence, Colorado, USA) producing (R)-(-)-linalool in flowers. GC traces are presented at the same scale (T = internal standard of 23.6 ng toluene) and numbered compounds represent volatile terpenoids (1 = β -myrcene, $2 = (Z)-\beta$ -ocimene, $3 = (E)-\beta$ -ocimene, 4 = ocimene epoxide, L = (R)-(-)linalool, $5 = \beta$ -caryophyllene, $6 = \alpha$ -humulene). Note that all of these peaks (including 4) are absent in the vegetative samples. Panels B, C and D show the mass spectra (m/z 40–350) at 9.15 min, the retention time for linalool under the chromatographic conditions used in this study (see methods). The correct spectrum for linalool is present only in panel B, corresponding to the floral headspace; the two vegetative samples shown have no peak at this retention time.

Additional file 4. Floral volatile data from parental field populations of *Oenothera harringtonii* used to set up transcriptomics experiments in greenhouse-grown plants.

Additional file 5. Phylogeny of terpene synthases including phased alleles for the putative (R)-(—)-linalool synthase reconstructed in this study.

Additional file 6. Principal components analysis of differential gene expression.

Additional file 7. Annotation of a 13,705 kb genomic contig (Contig ID 2552694) indicating the position, predicted full-length coding sequence, and predicted full-length protein sequence of the genomic homolog of the putative (R)-(—)-linalool synthase inferred from RNA-Seq data.

Additional file 8. Alignment of the predicted full-length *Oenothera harringtonii* (R)-(—)-linalool synthase protein sequence with the *Backhousia citriodora* (R)-(—)-linalool synthase protein sequence and the merged predicted (R)-(—)-linalool synthase transcripts from the *O. harringtonii* reference transcriptome assembly.

Additional file 9. GC-MS evidence that volatile emissions from petals ((R)-(—)-linalool in particular) are comparable in chemical composition and emission rates to those of the whole flower control, whereas emissions from sex organs are substantially weaker and are missing minor components (ocimene and farnesol derivatives) of the full volatile blend.

Acknowledgements

Thanks to Sandra Steiger (Justus-Liebig-Universität Gießen, Germany) for providing an authentic standard for methyl geranate. The authors thank Evan Hilpman, Sadie Todd, and Heather Rose Kates for assistance with floral fragrance collection in the field.

Authors' contributions

LLB, MGJ, GTB, RAL, RPO, TJ, JBF, RAR, KAS, and NJW designed the study, interpreted the data, and wrote the manuscript. LLB, RPO, GTB, and RAR performed the experiments. LLB, MGJ, GTB, TJ, RAR, and NJW analyzed the data. All authors read and approved the final manuscript.

Funding

This work was funded by grants from the National Science Foundation (USA) (DEB-1342873 to KAS, JBF, and NJW; DEB-1239992 to NJW; DEB-1342792 to RAR; DEB-1342805 to RAL; DBI-1461007 to JBF). Additional funding was provided by Amherst College and the Negaunee Institute for Plant Conservation Science and Action at the Chicago Botanic Garden.

Availability of data and materials

The Illumina RNA-Seq reads supporting the conclusions of this article are available from the NCBI Sequence Read Archive (BioProject PRJNA432694; https://www.ncbi.nlm.nih.gov/bioproject/PRJNA432694). The reference transcriptome assembly, mapping results, terpene synthase HMM and the alignment of terpene synthase sequences for phylogenetic analysis, and files used for the SNP analysis are currently available from the following link: https://doi.org/10.5061/dryad.np5hqbzrz.

Declarations

Ethics approval and consent to participate

Seed collections and land access complied with all relevant institutional, regional, and national guidelines as described in [69].

Consent for publication

Not applicable.

Competing interests

The authors declare that they have no competing interests.

Author details

¹Negaunee Institute for Plant Conservation Science and Action, Chicago Botanic Garden, 1000 Lake Cook Rd, Glencoe, IL 60022, USA. ²Department of Biology, Amherst College, 25 East Drive, Amherst, MA 01002, USA. ³Texas Tech University, Box 43131, Lubbock, TX 79409, USA. ⁴Cornell University, 215 Tower Rd, Ithaca, NY 14853, USA. ⁵University of Florida, 1881 Natural Area Drive, Gainesville, FL 32608, USA. ⁶Arizona State University, PO Box 875502, Tempe, AZ 85287, USA. ⁷Northwestern University, 2205 Tech Drive, Evanston, IL 60208, USA.

Received: 16 January 2021 Accepted: 30 December 2021 Published online: 12 February 2022

References

- Shuttleworth A, Johnson SD. The missing stink: Sulphur compounds can mediate a shift between fly and wasp pollination systems. Proc R Soc B Biol Sci. 2010;277:2811–9.
- Raguso RA. Wake up and smell the roses: the ecology and evolution of floral scent. Annu Rev Ecol Evol Syst. 2008;39:549–69.
- 3. Junker RR, Blüthgen N. Floral scents repel facultative flower visitors, but attract obligate ones. Ann Bot. 2010;105:777–82.
- Junker RR, Bluethgen N. Floral scents repel potentially nectar-thieving ants. Evol Ecol Res. 2008;10:295–308.
- Kessler D, Gase K, Baldwin IT. Field experiments with transformed plants reveal the sense of floral scents. Science. 2008;321:1200–2.
- Ashman T-L, Bradburn M, Cole DH, Blaney BH, Raguso RA. The scent of a male: the role of floral volatiles in pollination of a gender dimorphic plant. Ecology. 2005;86:2099–105.

- Terry I, Walter GH, Moore C, Roemer R, Hull C. Odor-mediated push-pull pollination in cycads. Science. 2007;318:70.
- Knudsen JT, Eriksson R, Gershenzon J, Ståhl B. Diversity and distribution of floral scent. Bot Rev. 2006;72:1–120.
- Delle-Vedove R, Schatz B, Dufay M. Understanding intraspecific variation of floral scent in light of evolutionary ecology. Ann Bot. 2017;120:1–20.
- Gross K, Sun M, Schiestl FP. Why do floral perfumes become different? Region-specific selection on floral scent in a terrestrial orchid. PLoS One. 2016;11:e0147975
- Sun M, Gross K, Schiestl FP. Floral adaptation to local pollinator guilds in a terrestrial orchid. Ann Bot. 2014;113:289–300.
- Mant J, Peakall R, Schiestl FP. Does selection on floral odor promote differentiation among populations and species of the sexually deceptive orchid genus *Ophrys*? Evolution. 2005;59:1449–63.
- Suinyuy TN, Donaldson JS, Johnson SD. Geographical variation in cone volatile composition among populations of the African cycad *Enceph-alartos villosus*. Biol J Linn Soc Lond. 2012;106:514–27.
- Nagegowda DA. Plant volatile terpenoid metabolism: biosynthetic genes, transcriptional regulation and subcellular compartmentation. FEBS Lett. 2010;584:2965–73.
- Onda Y, Mochida K, Yoshida T, Sakurai T, Seymour RS, Umekawa Y, et al. Transcriptome analysis of thermogenic *Arum concinnatum* reveals the molecular components of floral scent production. Sci Rep. 2015;5:08753.
- Magnard J-L, Roccia A, Caissard J-C, Vergne P, Sun P, Hecquet R, et al. Biosynthesis of monoterpene scent compounds in roses. Science. 2015;349:81–3
- Yue Y, Yu R, Fan Y. Transcriptome profiling provides new insights into the formation of floral scent in *Hedychium coronarium*. BMC Genomics. 2015;16:470.
- Hsiao Y-Y, Tsai W-C, Kuoh C-S, Huang T-H, Wang H-C, Wu T-S, et al. Comparison of transcripts in *Phalaenopsis bellina* and *Phalaenopsis equestris* (Orchidaceae) flowers to deduce monoterpene biosynthesis pathway. BMC Plant Biol. 2006;6:14.
- Amrad A, Moser M, Mandel T, de Vries M, Schuurink RC, Freitas L, et al. Gain and loss of floral scent production through changes in structural genes during pollinator-mediated speciation. Curr Biol. 2016;26:3303–12.
- Wong DCJ, Amarasinghe R, Rodriguez-Delgado C, Eyles R, Pichersky E, Peakall R. Tissue-specific floral transcriptome analysis of the sexually deceptive orchid *Chiloglottis trapeziformis* provides insights into the biosynthesis and regulation of its unique UV-B dependent floral volatile, Chiloglottone 1. Front Plant Sci. 2017;8:1260.
- Pichersky E, Raguso RA. Why do plants produce so many terpenoid compounds? New Phytol. 2016;3:692–702.
- 22. Chen F, Tholl D, Bohlmann J, Pichersky E. The family of terpene synthases in plants: a mid-size family of genes for specialized metabolism that is highly diversified throughout the kingdom. Plant J. 2011;66:212–29.
- 23. van Schie CCN, Haring MA, Schuurink RC. Tomato linalool synthase is induced in trichomes by jasmonic acid. Plant Mol Biol. 2007;64:251–63.
- 24. Linhart YB, Thompson JD. Thyme is of the essence: biochemical polymorphism and multi-species deterrence. Evol Ecol Res. 1999;1:151–71.
- Linhart YB, Gauthier P, Keefover-Ring K, Thompson JD. Variable phytotoxic effects of *Thymus vulgaris* (Lamiaceae) terpenes on associated species. Int J Plant Sci. 2015;176:20–30.
- Gouyon PH, Vernet P, Guillerm JL, Valdeyron G. Polymorphisms and environment: the adaptive value of the oil polymorphisms in *Thymus vulgaris* L. Heredity. 1986;57:59–66.
- Vernet P, Gouyon RH, Valdeyron G. Genetic control of the oil content in *Thymus vulgaris* L: a case of polymorphism in a biosynthetic chain. Genetica. 1986;69:227–31.
- Wagner WL, Stockhouse RE, Klein WM. The systematics and evolution of the Oenothera caespitosa species complex (Onagraceae). Monographs Syst Bot Missouri Bot Garden (USA). 1985;12:1–103.
- Raguso RA, Pichersky E. New perspectives in pollination biology: floral fragrances. A day in the life of a linalool molecule: chemical communication in a plant-pollinator system. Part 1: linalool biosynthesis in flowering plants. Plant Species Biol. 1999;14:95–120.
- Kawaano S, Odaki M, Yamaoka R, Oda-Tanabe M, Takeuchi M, Kawano N. Pollination biology of *Oenothera* (Onagraceae). The interplay between floral UV-absorbancy patterns and floral volatiles as signals to nocturnal insects. Plant Species Biol. 1995;10:31–8.

- Raguso RA, Kelber A, Pfaff M, Levin RA, McDade LA. Floral biology of north american *Oenothera* sect. *Lavauxia* (Onagraceae): advertisements, rewards, and extreme variation in floral depth. Ann Mo Bot Gard. 2007;94:236–57.
- Boachon B, Junker RR, Miesch L, Bassard J-E, Höfer R, Caillieaudeaux R, et al. CYP76C1 (cytochrome P450)-mediated linalool metabolism and the formation of volatile and soluble linalool oxides in *Arabidopsis* flowers: a strategy for defense against floral antagonists. Plant Cell. 2015;27:2972–90
- 33. Reisenman CE, Riffell JA, Bernays EA, Hildebrand JG. Antagonistic effects of floral scent in an insect-plant interaction. Proc Biol Sci. 2010:277:2371–9.
- Raguso RA. More lessons from linalool: insights gained from a ubiquitous floral volatile. Curr Opin Plant Biol. 2016;32:31–6.
- Okamoto T. Species-specific floral scents as olfactory cues in pollinator moths. In: Kato M, Kawakita A, editors. Obligate pollination mutualism. Tokyo: Springer Japan; 2017. p. 169–79.
- Rhodes MK, Fant JB, Skogen KA. Local topography shapes fine-scale spatial genetic structure in the Arkansas Valley evening primrose, Oenothera harringtonii (Onagraceae). J Hered. 2014;105:806–15.
- Bischoff M, Raguso RA, Jürgens A, Campbell DR. Context-dependent reproductive isolation mediated by floral scent and color. Evolution. 2015;69:1–13.
- 38. Kessler D, Kallenbach M, Diezel C, Rothe E, Murdock M, Baldwin IT. How scent and nectar influence floral antagonists and mutualists. Elife. 2015;4:e07641
- Bruzzese DJ, Wagner DL, Harrison T, Jogesh T, Overson RP, Wickett NJ, et al. Phylogeny, host use, and diversification in the moth family Momphidae (Lepidoptera: Gelechioidea). PLoS One. 2019;14:e0207833.
- Artz DR, Villagra CA, Raguso RA. Spatiotemporal variation in the reproductive ecology of two parapatric subspecies of *Oenothera cespitosa* (Onagraceae). Am J Bot. 2010;97:1498–510.
- 41. He J, Fandino RA, Halitschke R, Luck K, Köllner TG, Murdock MH, et al. An unbiased approach elucidates variation in (S)-(+)-linalool, a context-specific mediator of a tri-trophic interaction in wild tobacco. Proc Natl Acad Sci U S A. 2019;116:14651–60.
- 42. Dudareva N, Cseke L, Blanc VM, Pichersky E. Evolution of floral scent in *Clarkia*: novel patterns of S-linalool synthase gene expression in the *C. breweri* flower. Plant Cell. 1996;8:1137–48.
- 43. Cseke L, Dudareva N, Pichersky E. Structure and evolution of linalool synthase. Mol Biol Evol. 1998;15:1491–8.
- Byng JW, Chase MW, Christenhusz MJM, Fay MF, Judd WS, Mabberley DJ, et al. An update of the angiosperm phylogeny group classification for the orders and families of flowering plants: APG IV. Bot J Linn Soc. 2016;181:1–20
- 45. Theiss KE, Holsinger KE, Evans MEK. Breeding system variation in 10 evening primroses (*Oenothera* sections *Anogra* and *Kleinia*; Onagraceae). Am J Bot. 2010;97:1031–9.
- Bryant DM, Johnson K, DiTommaso T, Tickle T, Couger MB, Payzin-Dogru D, et al. A tissue-mapped axolotl de novo transcriptome enables identification of limb regeneration factors. Cell Rep. 2017;18:762–76.
- Lamesch P, Berardini TZ, Li D, Swarbreck D, Wilks C, Sasidharan R, et al. The *Arabidopsis* information resource (TAIR): improved gene annotation and new tools. Nucleic Acids Res. 2012;40:D1202–10.
- Ginglinger J-F, Boachon B, Höfer R, Paetz C, Köllner TG, Miesch L, et al. Gene coexpression analysis reveals complex metabolism of the monoterpene alcohol linalool in *Arabidopsis* flowers. Plant Cell. 2013:25:4640–57.
- 49. Jones CG, Moniodis J, Zulak KG, Scaffidi A, Plummer JA, Ghisalberti EL, et al. Sandalwood fragrance biosynthesis involves sesquiterpene synthases of both the terpene synthase (TPS)-a and TPS-b subfamilies, including santalene synthases. J Biol Chem. 2011;286:17445–54.
- Huang M, Sanchez-Moreiras AM, Abel C, Sohrabi R, Lee S, Gershenzon J, et al. The major volatile organic compound emitted from *Arabidopsis* thaliana flowers, the sesquiterpene (E)-β-caryophyllene, is a defense against a bacterial pathogen. New Phytol. 2012;193:997–1008.
- 51. Kessler A, Baldwin IT. Defensive function of herbivore-induced plant volatile emissions in nature. Science. 2001;291:2141–4.
- Xiao Y, Wang Q, Erb M, Turlings TCJ, Ge L, Hu L, et al. Specific herbivoreinduced volatiles defend plants and determine insect community composition in the field. Ecol Lett. 2012;15:1130–9.

Bechen et al. BMC Genomics (2022) 23:124 Page 17 of 17

- Huang X-Z, Chen J-Y, Xiao H-J, Xiao Y-T, Wu J, Wu J-X, et al. Dynamic transcriptome analysis and volatile profiling of Gossypium hirsutum in response to the cotton bollworm Helicoverpa armigera. Sci Rep. 2015;5:11867.
- Schnee C, Köllner TG, Held M, Turlings TCJ, Gershenzon J, Degenhardt J. The products of a single maize sesquiterpene synthase form a volatile defense signal that attracts natural enemies of maize herbivores. Proc Natl Acad Sci U S A. 2006;103:1129–34.
- Clark EL, Carroll AL, Huber DPW. Differences in the constitutive terpene profile of lodgepole pine across a geographical range in British Columbia, and correlation with historical attack by mountain pine beetle. Can Entomol. 2010;142:557–73.
- Pichersky E, Raguso RA, Lewinsohn E, Croteau R. Floral scent production in *Clarkia* (Onagraceae) (I. localization and developmental modulation of monoterpene emission and linalool synthase activity). Plant Physiol. 1994:106:1533–40.
- Raguso RA, Pichersky E. Floral volatiles from Clarkia breweri and C. concinna (Onagraceae): recent evolution of floral scent and moth pollination. Plant Syst Evol. 1995;194:55–67.
- Briscoe Runquist RD, Chu E, Iverson JL, Kopp JC, Moeller DA. Rapid evolution of reproductive isolation between incipient outcrossing and selfing *Clarkia* species. Evolution. 2014;68:2885–900.
- Jia JW, Crock J, Lu S, Croteau R, Chen XY. (3R)-linalool synthase from Artemisia annua L.: cDNA isolation, characterization, and wound induction. Arch Biochem Biophys. 1999;372:143–9.
- Honaas LA, Wafula EK, Wickett NJ, Der JP, Zhang Y, Edger PP, et al. Selecting superior de novo transcriptome assemblies: lessons learned by leveraging the best plant genome. PLoS One. 2016;11:e0146062.
- Everaert C, Luypaert M, Maag JLV, Cheng QX, Dinger ME, Hellemans J, et al. Benchmarking of RNA-sequencing analysis workflows using whole-transcriptome RT-qPCR expression data. Sci Rep. 2017;7:1559.
- Griffith M, Griffith OL, Mwenifumbo J, Goya R, Morrissy AS, Morin RD, et al. Alternative expression analysis by RNA sequencing. Nat Methods. 2010;7:843–7
- 63. Shi Y, He M. Differential gene expression identified by RNA-Seq and qPCR in two sizes of pearl oyster (*Pinctada fucata*). Gene. 2014;538:313–22.
- Huang M, Abel C, Sohrabi R, Petri J, Haupt I, Cosimano J, et al. Variation of herbivore-induced volatile terpenes among *Arabidopsis* ecotypes depends on allelic differences and subcellular targeting of two terpene synthases, TPS02 and TPS03. Plant Physiol. 2010;153:1293–310.
- Xu Y-H, Wang J-W, Wang S, Wang J-Y, Chen X-Y. Characterization of GaW-RKY1, a cotton transcription factor that regulates the sesquiterpene synthase gene (+)-delta-cadinene synthase-a. Plant Physiol. 2004;135:507–15.
- Nieuwenhuizen NJ, Chen X, Wang MY, Matich AJ, Perez RL, Allan AC, et al. Natural variation in monoterpene synthesis in kiwifruit: transcriptional regulation of terpene synthases by NAC and ETHYLENE-INSENSITIVE3-like transcription factors. Plant Physiol. 2015;167:1243–58.
- 67. Singh N, Sharma A. In-silico identification of miRNAs and their regulating target functions in *Ocimum basilicum*. Gene. 2014;552:277–82.
- Sobhani Najafabadi A, Naghavi MR. Mining Ferula gummosa transcriptome to identify miRNAs involved in the regulation and biosynthesis of terpenes. Gene. 2018;645:41–7.
- Skogen KA, Jogesh T, Hilpman ET, Todd SL, Rhodes MK, Still SM, et al. Landuse change has no detectable effect on reproduction of a disturbanceadapted, hawkmoth-pollinated plant species. Am J Bot. 2016;103:1950–63.
- Adams RP. Identification of essential oil components by gas chromatography/quadrupole mass spectroscopy. 3rd ed. Illinois: Allured Publishing Corporation; 2001. p. 456.
- Hanneguelle S, Thibault JN, Naulet N, Martin GJ. Authentication of essential oils containing linalool and linalyl acetate by isotopic methods. J Agric Food Chem. 1992;40:81–7.
- Pichersky E, Lewinsohn E, Croteau R. Purification and characterization of S-linalool synthase, an enzyme involved in the production of floral scent in Clarkia breweri. Arch Biochem Biophys. 1995;316:803–7.
- Andrews S. FastQC: A quality control tool for high throughput sequence data. 2010. https://www.bioinformatics.babraham.ac.uk/projects/fastqc/.
- Bolger AM, Lohse M, Usadel B. Trimmomatic: a flexible trimmer for Illumina sequence data. Bioinformatics. 2014;30(15):2114–20.
- Langmead B, Salzberg SL. Fast gapped-read alignment with bowtie 2. Nat Methods. 2012;9:357–9.

- Lagesen K, Hallin P, Rødland EA, Staerfeldt H-H, Rognes T, Ussery DW. RNAmmer: consistent and rapid annotation of ribosomal RNA genes. Nucleic Acids Res. 2007;35:3100–8.
- Grabherr MG, Haas BJ, Yassour M, Levin JZ, Thompson DA, Amit I, et al. Trinity: reconstructing a full-length transcriptome without a genome from RNA-Seq data. Nat Biotechnol. 2011;29:644–52.
- Haas BJ, Papanicolaou A, Yassour M, Grabherr M, Blood PD, Bowden J, et al. De novo transcript sequence reconstruction from RNA-seq using the trinity platform for reference generation and analysis. Nat Protoc. 2013;8(8):1494–512.
- O'Neil ST, Emrich SJ. Assessing De novo transcriptome assembly metrics for consistency and utility. BMC Genomics. 2013;14:465.
- 80. Camacho C, Coulouris G, Avagyan V, Ma N, Papadopoulos J, Bealer K, et al. BLAST+: architecture and applications. BMC Bioinformatics. 2009;10:421.
- Boeckmann B, Blatter M-C, Famiglietti L, Hinz U, Lane L, Roechert B, et al. Protein variety and functional diversity: Swiss-Prot annotation in its biological context. C R Biol. 2005;328:882–99.
- Eddy SR. Accelerated Profile HMM searches. PLoS Comput Biol. 2011;7:e1002195. https://doi.org/10.1371/journal.pcbi.1002195.
- Finn RD, Coggill P, Eberhardt RY, Eddy SR, Mistry J, Mitchell AL, et al. The Pfam protein families database: towards a more sustainable future. Nucleic Acids Res. 2016;44:D279–85.
- Petersen TN, Brunak S, von Heijne G, Nielsen H. SignalP 4.0: discriminating signal peptides from transmembrane regions. Nat Methods. 2011;8(10):785–6.
- 85. Krogh A, Larsson B, von Heijne G, Sonnhammer EL. Predicting transmembrane protein topology with a hidden Markov model: application to complete genomes. J Mol Biol. 2001;305:567–80.
- Huerta-Cepas J, Szklarczyk D, Forslund K, Cook H, Heller D, Walter MC, et al. eggNOG 4.5: a hierarchical orthology framework with improved functional annotations for eukaryotic, prokaryotic and viral sequences. Nucleic Acids Res. 2016;44:D286–93.
- 87. Gene Ontology Consortium. Gene ontology consortium: going forward. Nucleic Acids Res. 2015;43:D1049–56.
- Kanehisa M, Sato Y, Kawashima M, Furumichi M, Tanabe M. KEGG as a reference resource for gene and protein annotation. Nucleic Acids Res. 2016;44:D457–62.
- 89. R Core Team. R: A Language and Environment for Statistical Computing. https://www.R-project.org.
- Li B, Dewey CN. RSEM: accurate transcript quantification from RNA-Seq data with or without a reference genome. BMC Bioinformatics. 2011;12:323.
- Robinson MD, McCarthy DJ, Smyth GK. edgeR: a bioconductor package for differential expression analysis of digital gene expression data. Bioinformatics. 2010;26:139–40.
- McCarthy DJ, Chen Y, Smyth GK. Differential expression analysis of multifactor RNA-Seq experiments with respect to biological variation. Nucleic Acids Res. 2012;40:4288–97.
- Bohlmann J, Steele CL, Croteau R. Monoterpene synthases from grand fir (Abies grandis). cDNA isolation, characterization, and functional expression of myrcene synthase, (—)-(4S)-limonene synthase, and (—)-(1S,5S)-pinene synthase. J Biol Chem. 1997;272:21784—92.
- 94. Dudareva N, Martin D, Kish CM, Kolosova N, Gorenstein N, Fäldt J, et al. (E)-beta-ocimene and myrcene synthase genes of floral scent biosynthesis in snapdragon: function and expression of three terpene synthase genes of a new terpene synthase subfamily. Plant Cell. 2003;15:1227–41.
- Katoh K, Standley DM. MAFFT multiple sequence alignment software version 7: improvements in performance and usability. Mol Biol Evol. 2013;30:772–80.
- 96. Stamatakis A. RAxML version 8: a tool for phylogenetic analysis and postanalysis of large phylogenies. Bioinformatics. 2014;30:1312–3.
- Patterson M, Marschall T, Pisanti N, van Iersel L, Stougie L, Klau GW, et al. WhatsHap: weighted haplotype assembly for future-generation sequencing reads. J Comput Biol. 2015;22:498–509.

Publisher's Note

Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.